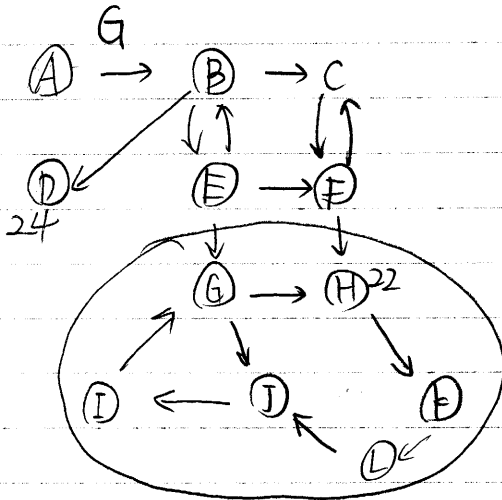
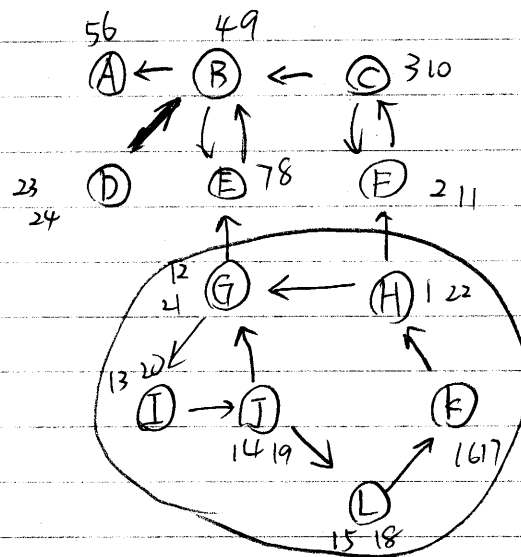


2018.3.6 Lecture 12.

A source vertex in a directed



sink scc



source scc

- 1) Do DFS numbering as reverse graph
  - 2) Just traverse in decreasing order of post (v) in G and find all reachable vertices from v
- every such series a scc

$\begin{matrix} D_{24} \\ \downarrow \\ D \end{matrix}$ 
 $\begin{matrix} H \\ \downarrow \\ H K L J I G \end{matrix}$ 
 $\begin{matrix} F \\ \downarrow \\ F C \end{matrix}$

## Lecture 12. Chapter 3.

### 3.4 Strong connected components

#### 3. Strongly connected components (SCC)

Directed graph (with cycles)

SCC: maximal set of vertices that are mutually reachable from each other

$\{x, y\} \in \text{SCC}$

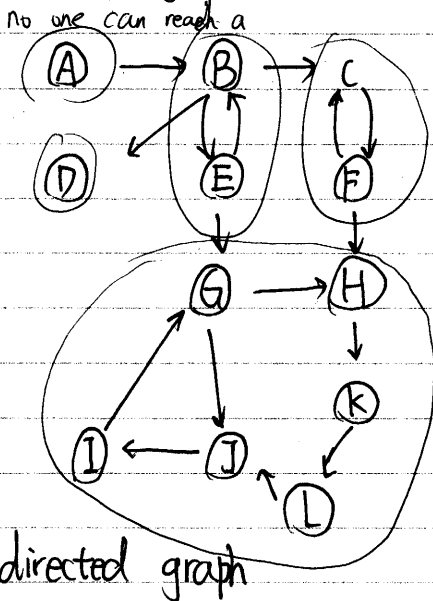
$\Rightarrow \begin{cases} x \text{ can reach } y \\ y \text{ can reach } x \end{cases}$  mutually reachable

"largest" such set of vertex

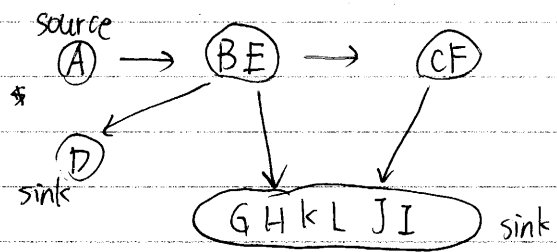
$\downarrow$  we can not add another vertex to SCC.

Connectivity in directed graph:  $u \leftrightarrow v$ .

Directed graph has an interrupt DAG structure over SCC



no one can reach A  
D can reach nobody.



SCC DAG

Any directed graph is a DAG over its strongly connected component

#### SCC Algorithm

Given a directed graph  $G = (V, E)$

- 1) Identify successively all "sink" nodes
- 2) From call sink, do a DFS to extract the SCC remove it  $\rightarrow$  remove it  $\rightarrow$  mark all vertex as visited

## Lecture 12

Topo sort:

- 1) Do a DFS numbering  $O(|V| + |E|)$  order list
- 2) ~~Sort~~ <sup>output</sup> vertex in decreasing order of post [V] value.

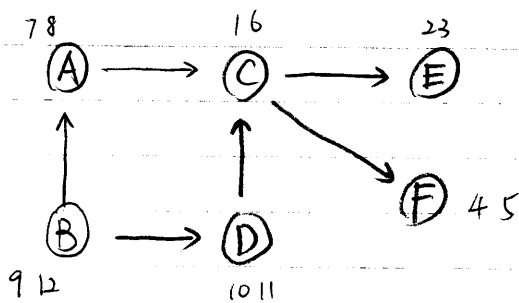
~~$O(|V| \log |V|)$~~   $O(|V|)$

B (D A) : C (F E)  
12 11 8 6 4 3

This is a topological sort

$O(|V| + |E| + V \log |V|)$

$O(|E| + \cancel{V \log |V|})$   $O(|V| + |E|)$



post order list

E - 3

F - 4

C - 6

A - 8

D - 11

B - 12

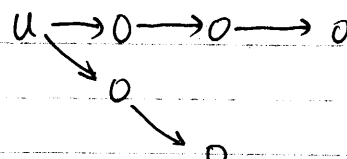
sorting is for free

### 4. Proof of correctness

Interval of u [ ]

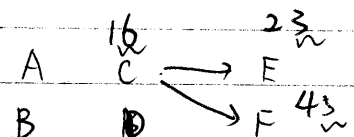
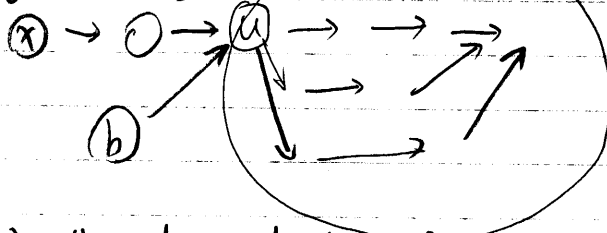
contains all reachable

node's interval



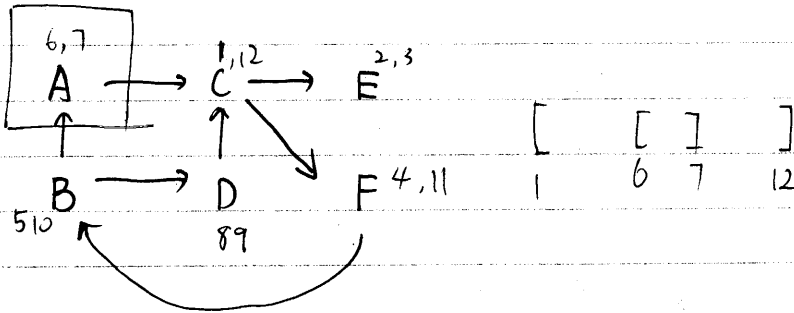
post(u) must be larger than all other nodes that are reachable from u.

[100, 200]



- 1) all descendants of u have smaller post value.
- 2) All ancestors of u have larger post value.

## Lecture 12



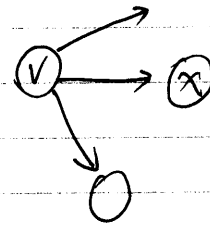
Algo to detect cycles

1) Do DFS intervals

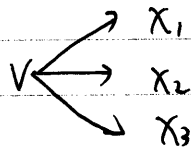
$O(|V| + |E|)$   
linear time

2)  $\forall v \in V$

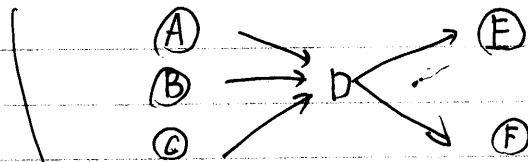
$O(|V| + |E|)$  ← for all  $x \in \text{neighbors of } v$   
if  $\text{interval}[x] \geq \text{interval}[v]$   
cycle found.



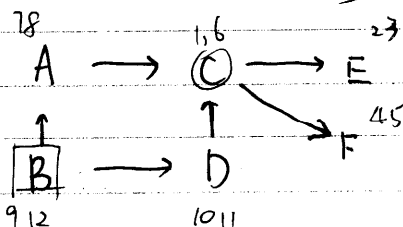
$O(|V| + |E|)$  worst case



3. Topological sort dependency graph  
DAG



all of the pre-requisites of a node must be before that node in ordering



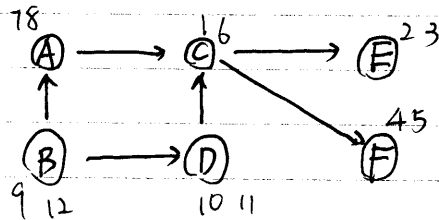
only possible for DAG.

2018.3.6

## LECTURE 12

### 1. DFS numbering

pre-order number  
post-order number

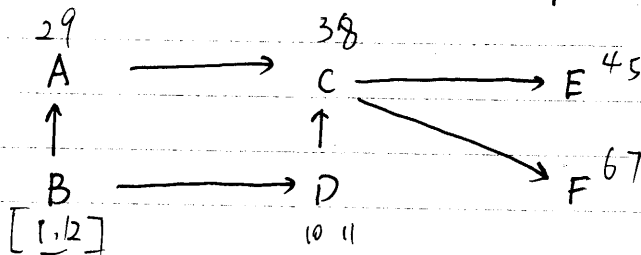


DFS numbering  
many of them

1) Where we start

2) How we visit the outgoing edges

Containment of ~~intervals~~ <sup>intervals</sup> indicates  
ancestor-descendant relationship



★ If we start at a source then all vertices reachable from that source will have small interval

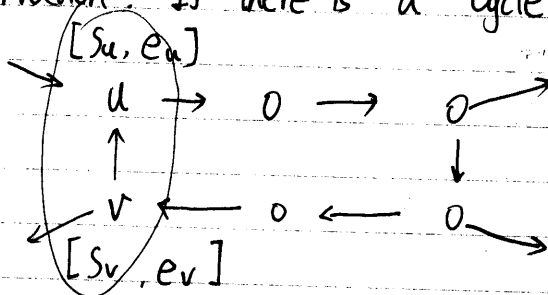
### 2. Detecting cycle

DAG → directed Acyclic Graph

give a directed graph, is it a DAG

→ Does it have a cycle or not?

Observation: If there is a cycle,  $\exists$  a node  $u$  and  $v$  such that



such that: Interval of  $v \leq$  Interval of  $u$

★  $[s_v, e_v] \leq [s_u, e_u]$

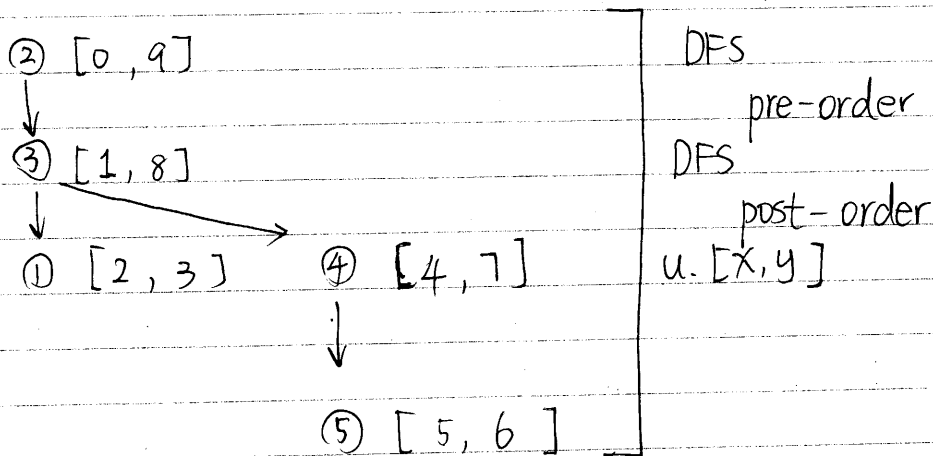
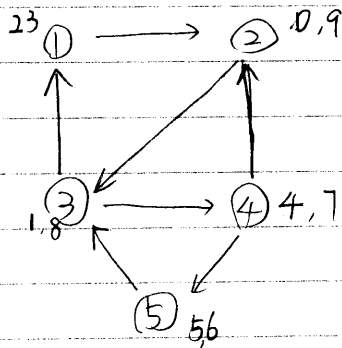
If at  $v$ , we found a link to some vertex  $u$  such that Intervals of  $v \leq$  Interval of  $u$  that has already been visited then  $\exists$  a cycle

2018.2.27

## Lecture 11 Chapter 3

### 1. DFS with pre & post number

order of visit in DFS exploration  
directed graph

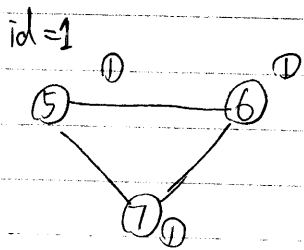
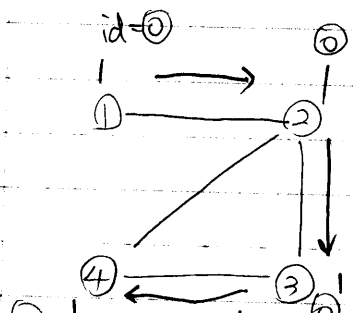


reachability can be checked in constant time after DFS.

Q: is there a path from ② to ①?

$[0, 9]$        $[2, 3]$   
since  $[2, 3] < [0, 9]$   
True!

Reachability: source encloses end.



disconnected graph

⑤ Connected components

↳ a maximal set of mutually reachable vertices

$CC_1 = \{1, 2, 3, 4\}$

$CC_2 = \{5, 6, 7\}$

DFS to find connected components

$CC(G)$

for all  $u \in V$   $O(n)$   
 $visited(u) = 0$

$id = 0$

for all  $u \in V \leftarrow O(n)$

if  $visited(u) = 0$ :

DFS explore( $u, id$ )

$id = id + 1$

# of recursive calls  
 is  $O(n)$

cost of each call?

DFS explore( $u, id$ )

$visited(u) = 1$

$id(u) = id$  neighbour

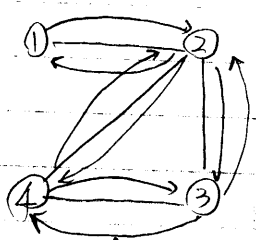
for all  $x \in N(u)$

if  $visited(x) = 0$ :

DFS explore( $x$ )

once during explore

$x$ , once during explore  $y$



every edge will  
 be checked exactly  
 twice

$O(n)$  vertex

+

$2m = O(m)$

DFS  $O(n+m)$

$O(n+m)$

linear time algorithm in the graph "size"

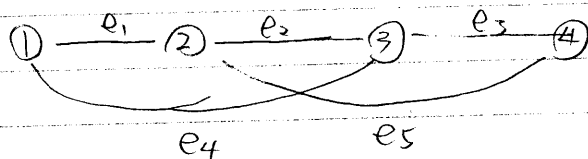
Aggregate analysis: across all nodes

1. each node visited once

2. We look at all its neighbour.

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# Lecture 11

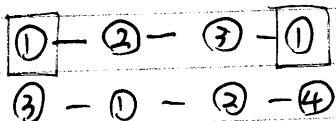


Walk { ② - e<sub>2</sub> - ③ - e<sub>4</sub> - ① - e<sub>1</sub> - ② - e<sub>5</sub> - ④  
 ② - ③ - ① - ③ - ④

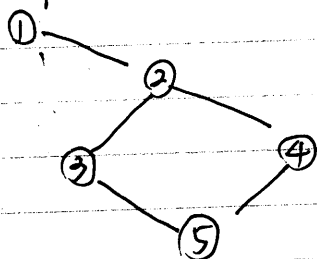
(2, 3, 1, 2, 4)

Path: ~~no~~ duplicate vertex allowed, except for the start & end.

Cycle: is a path with same start & end



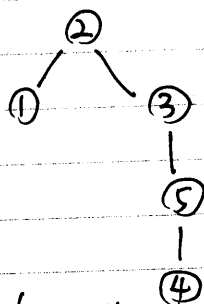
DFS: Depth First search



linear time procedure. (basic question: What part of graph are reachable from a given vertex.

DFS explore (u) neighbour  
 for  $x \in N(u)$ :  
~~DFS explore (x)~~  
 if not visited (x),  
 DFS explore (x)

jump to neighbour with smallest ind.



order of exploration  
 DFS tree

DFS → find all reachable vertices. from u

reachable:  $\Rightarrow$  a path for u to s.



2018.2.27 Lecture 11

a graph is dense if  $m = O(n^2)$

2). Real-world: graphs are sparse:  
 $m = O(n)$

a node / vertex

connected to some max const # other nodes

$\text{degree}(v) = \# \text{ of nodes that are adjacent to } v$   
 $= |N(v)| \leftarrow \text{size of neighbour}$

eg: FB  $n = \text{billion}$

①  $\text{degree}(u) \leq 10^6 \text{ max}$

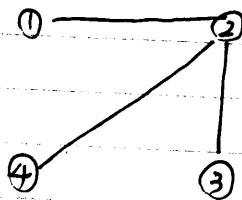
avg  $\text{degree}(n) \leq 10 - 100$

$O(n^2)$  edge  $\leftarrow \text{max}$

For sparse graph

Adjacency list representation

$\hookrightarrow$  keep track of presence of an edge.



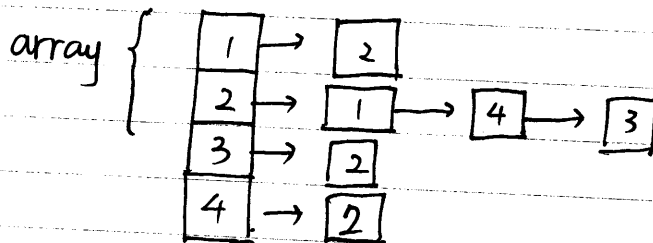
$|E| = |m|$

Q:  $(4, 3)$  exist?  
 $(3, 4)$

connect

~~$O(N(u))$~~

$O(N(u))$



space =  $O(m)$   $\leftarrow$  degree, edge

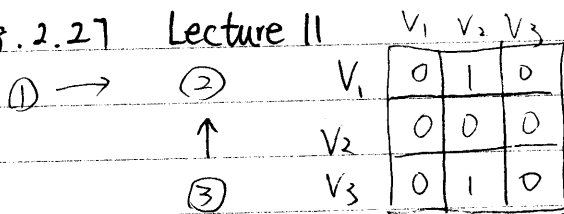
$\hookrightarrow O(n)$  for sparse node

walk versus path

walk is any sequence

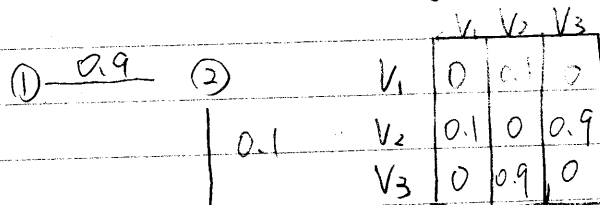
of alternating vertices & edge in a graph

2018.2.27 Lecture 11



directed

asymmetric matrix



(Symmetric ?)

③

weighted adjacent matrix

Neighbour of a vertex  $V$

$$N(V) = \{u \mid (V, u) \in E\}$$

↑ set of all vertex "adjacent" to  $V$

1						
2	1	0	1	0	0	1

$$N(2) = \{1, 3, 6\}$$

existence of edge  $A_{ij}$

for adjacency matrix  $N(V)$  takes  $O(n)$  time

$A = n \times n$  matrix

$= O(n^2)$  quadratic space

↑

has the record both the existence & absence of an edge.

1). Dense graph

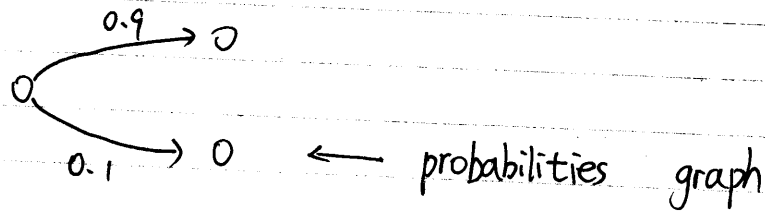
↓ a large fraction of the possible edge exist

$G = (V, E)$

$$\text{density} = \frac{|E|}{\# \text{ of possible edge}} = \frac{m}{\binom{n}{2}} \leftarrow \begin{array}{l} \text{edge \# of actual edge} \\ \# \text{ of possible edge} \end{array}$$

$$\text{undirected} = |V| = n \quad \binom{n}{2} = \frac{n(n-1)}{2}$$

## Lecture 11



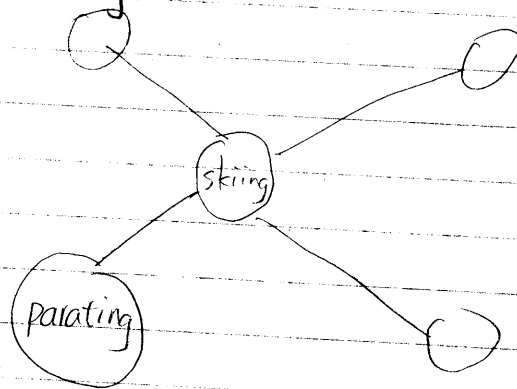
### 4. labeled vs unlabeled

↓ there are "labels" on the vertices & edge

$$G = (V, E, L_v, L_e)$$

$L_v(v)$  = label for  $v$

$L_e(e)$  = label on an edge  $e$



### 5. Representation

Adjacency matrix

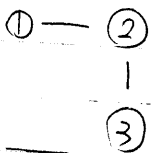
$$G = (V, E)$$

$$|V| = n$$

$$|E| = m$$

$A$

	$v_1$	$v_2$	...	$v_n$
$v_1$	0	1		
$v_2$	1	0		
...			0	
...				0
$v_n$				0



	1	2	3
1	0	1	0
2	1	0	1
3	0	1	0

$n \times n$  symmetric binary matrix

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## Lecture 11

Depth first search

1.  $G = (V, E)$

graph

vertex  $= \{v_1, v_2, v_3, \dots\}$

$|V| = n$  order of graph

$E = \{(u, v) \mid u, v \in V\}$

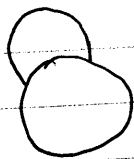
set of edge

ordered pair  $u \rightarrow v \leftarrow$  directed  $(u, v) (v, u)$

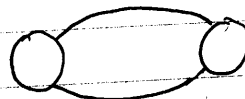
unordered  $u \rightarrow v \leftarrow$  undirected  $(u, v) = (v, u)$

$|E| = m$  size of graph

2.



self-loop  $\times$



$\times$

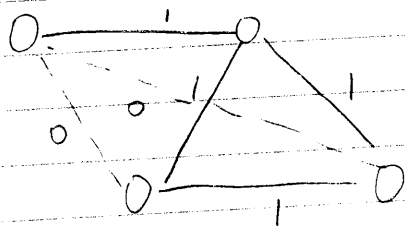
simple graphs  $\Rightarrow$  no self loop, no multigraph



$\checkmark$

3.  $G = (V, E)$

binary representation



weighted graph:

$G = (V, E, w)$

$V$  = vertices

$E$  = edges

$w(e) \in \mathbb{R}$  is the weight on edge  $e = (u, v)$

